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Human and computational models of atopic dermatitis

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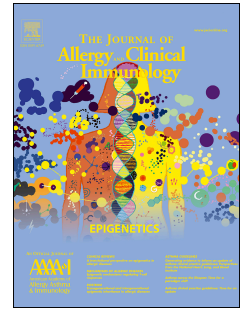
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Human and computational models of atopic dermatitis: a review and perspectives by an expert panel of the International Eczema Council

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Abstract

Atopic dermatitis (AD) is a prevalent disease worldwide associated with systemic co-morbidities, representing a significant burden on individuals, their families and society. Therapeutic options for AD remain limited, in part due to lack of well-characterised animal models. To better define pathophysiological mechanisms and to identify novel therapeutic targets and biomarkers that predict therapeutic response, there has been increasing interest in developing experimental approaches to study the pathogenesis of human AD *in vivo*, *in vitro*, and *in silico*. This review critically appraises a range of models including: genetic mutations relevant to AD; experimental challenge of human skin *in vivo*; tissue culture models; integration of “omic” datasets; and the development of predictive computational models. Whilst no one individual model recapitulates the complex AD pathophysiology, our review highlights insights gained into key elements of cutaneous biology, molecular pathways and therapeutic target identification through each approach. Recent developments in computational analysis, including the application of machine learning and a systems approach to data integration and predictive modelling, highlight the applicability of these methods to AD subclassification (endotyping), therapy development and precision medicine. Such predictive modelling will highlight knowledge gaps, further inform refinement of biological models, and support new experimental and systems approaches to AD.

Key words: Atopic dermatitis, atopic eczema, Endotype, Human models, Machine learning, Mechanistic models, Precision medicine, Tissue culture models, Skin equivalents, Systems biology

Abbreviations

ACD	Allergic contact dermatitis
AD	Atopic dermatitis
APT	Atopy Patch Test
ILs	Interleukins
IRFs	Interferon regulatory factors

78	IPEX	Polyendocrinopathy Enteropathy X-linked syndrome
79	LV	Langerhans cells
80	PD	Pharmacodynamic
81	PK	Pharmacokinetic
82	RAST	Radioallergosorbent test
83	RNA-Seq	RNA-sequencing
84	SPT	Skin prick testing

85

86

87 **Introduction**

88 Atopic dermatitis (AD; synonym atopic eczema) has a complex aetiology, involving multiple genetic and
89 environmental factors^{1 2}. With its very high incidence in childhood, chronicity, devastating effect on quality
90 of life for affected patients and their families, enormous socio-economic costs, and limited therapeutic
91 options to date, AD represents a major challenge. Furthermore, there is clear evidence that AD represents a
92 systemic inflammatory disease with multiple comorbidities extending beyond the well-recognized atopic
93 associations³. Consequently, a number of animal models have been developed and utilized by investigators
94 and the pharmaceutical industry to better understand the disease and consider new pathways to target⁴.
95 However, as recently reviewed, mouse models do not adequately reflect the transcriptomic and gene
96 pathways activated in human AD skin⁵ and the intrinsic difference between mouse and human skin
97 represents a barrier to direct translation of findings from animals into human disease. Consequently, there
98 has been increasing interest in experimental studies in humans (in part facilitated by technological and
99 “omic” developments), cell culture models utilizing human tissue, and the use of computational or
100 mathematical models that are developed by integrating these data. In this review article, we have used the
101 term “human AD model” to define representations of the disease state and interventions that enable
102 scientific insight into disease pathogenesis, disease course, and response to therapy. We delineate and
103 critically appraise these AD modelling approaches that range from the experimental study of human skin *in*
104 *vivo* (including challenge studies and detailed phenotyping and investigation of patients harboring specific
105 genetic mutations), the generation of AD-relevant models using immunological, genetic and molecular
106 methods in 2D and 3D human tissue culture, to the development of *in silico* computational models using a
107 systems biology approach. Whilst a reductionist approach cannot by definition recapitulate the full
108 spectrum of AD, these models have greatly increased our understanding of the molecular drivers of AD and
109 provide a powerful tool for preclinical drug development and target validation. However, just as the
110 etiology, clinical expression, and severity of AD range broadly among patients, *in vitro* and *in silico* models
111 of AD vary widely both in how the AD phenotype is induced and how the models are evaluated. Therefore,
112 we invited members of the International Eczema Council (IEC; www.eczemacouncil.org), a group of experts

in AD, and associated authorities in the field to contribute to a scoping and development meeting and subsequently to evaluate and critically appraise the breadth of human AD and computational models to determine their strengths and weaknesses in how they recapitulate the pathophysiology of AD and enable therapeutics to be tested and validated.

***In vivo* models of AD**

To dissect the pathogenesis of AD, two general approaches using human *in vivo* models have been followed:

i) the study of rare genetic variants with AD-like phenotypes; and ii) the experimental challenge of AD or non-AD subjects with allergens or irritants. Regarding the first approach, numerous studies have characterized genetic disorders that display skin barrier function abnormalities. Most often, these studies characterized ichthyosis vulgaris, a disease that allowed insights into the function of the epidermal differentiation gene *FLG* (encoding filaggrin), in which mutations show the strongest association to AD development of all known genes⁶ (Figure 1). Other studies have focused on disorders characterized by systemic inflammation³ and immunodeficiency with AD-like skin manifestations (Figure 1). One example is patients suffering from Immunodysregulation Polyendocrinopathy Enteropathy X-linked (IPEX) syndrome that serves as a model to study how systemic imbalances in the Treg population can drive cutaneous AD-like inflammation⁷. In addition, the link between type 2 immunity, transcription factors such as JAK or STAT, and high levels of IgE was investigated in immunodeficiency syndromes such as STAT3 and DOCK-8 hyper-IgE syndromes or combined immunodeficiency disorders^{8,9}. Table S1 lists the main genetic conditions that have provided insight into AD pathogenesis to date. Whilst the study of rare variants offers the opportunity to delineate distinct molecular mechanisms and control pathways of a particular phenotype, and thus may be regarded as “human models of AD”, a limitation of this approach is that not all observed phenomena are relevant in AD, which is more complex and heterogeneous than monogenic disorders.

The second *in vivo* approach to study the pathogenesis of AD is standardized challenge with allergens or other environmental factors. The most commonly used model is the Atopy Patch Test (APT), an

epicutaneous challenge of specific allergens dissolved in vehicle¹⁰, which has provided insight into the temporal development of immune phenomena in AD¹¹ (Table S2). Although developed in part to define clinically relevant reactions to aero-allergens, food allergens and autoantigens^{12 13 14}, it's validity and predictive value depend on a variety of factors in the protocol¹⁵ and the APT is not used routinely in clinical practice. Experimentally, the APT has provided insights into the the temporal sequence of cutaneous cellular infiltrates. Acute skin lesions show a highly reproducible Th2 dominant infiltrate¹⁶, although other cell types including Th17 cells are also present^{17 18}. This Th2 dominance is in sharp contrast to other inflammatory skin diseases such as psoriasis^{19, 20}. Time course studies have shown that additional immune cell subsets, such as Th1 and Th22 cells, progressively infiltrate the skin during an ongoing APT reaction, mirroring the cellular composition of acute versus chronic human AD^{17 21}. The APT has also been used to characterize dendritic cells within early lesional AD skin, e.g. Inflammatory dendritic epidermal cells¹⁸. Furthermore, the APT has provided insights on the interaction of microbiota and our immune system, in particular the role of bacterial-derived superantigens acting as an amplifier of the allergen specific cutaneous response in AD^{21, 22 23}. In all these experimental APT studies, the population of AD subjects were well defined with specific inclusion and exclusion criteria (although the precise definitions of AD varied); in most studies AD, together with specific IgE to the corresponding allergen used in the APT, was an inclusion criterion.

Hapten challenge to induce classical allergic contact dermatitis (ACD) in AD patients has also broadened our understanding of AD pathogenesis (Table S2). Whether AD patients have an increased risk of ACD remains controversial and may depend on whether they harbor *FLG* mutations, which may allowed increased penetration of allergens. However, attenuated ACD reactions have been reported in AD subjects compared to controls in a severity-dependent manner^{24, 25}. This might be due to the fact that haptens induce distinct immune responses²⁶, with fragrances mimicking the Th2/Th22 dominance of AD while nickel, DNCB, or imiquimod²⁷ induced Th1/Th17 skewed immune responses. Of note, AD patients show a Th2-skewed ACD reaction²⁸, and this immune deviation might account for the diminished ACD prevalence in AD. A Th2

immune reaction profile of AD patients was also observed in an aero-challenge setup²⁹, as well as when challenging AD patients with physical factors such as hard water^{30, 31}.

All current challenge models have some limitations (Table S2), as they only represent acute reactions and the small areas of applications cannot reproduce the intense pruritus and sleep disturbances usually present in AD. Furthermore, to date they have not stratified for genetic differences/endotypes amongst AD patients comparing APTs in patients with and without *FLG* mutations, for example, might be a useful line of future investigation. Moreover, in the future, molecular profiling of lesional skin from standardized challenge models, adjusted according to AD endotype, might be used in early clinical studies to evaluate the potential of new drugs to improve AD³².

***In Vitro* Models**

As shown in Table S3, there are several 2D cell culture and 3D organotypic models for AD that complement each other in addressing specific experimental questions. While, 2D cell culture models (by definition) do not duplicate the architecture of skin, they are amenable to high-throughput techniques for drug discovery and target validation (2D model section, Supplementary Table S3). Accordingly, Otsuka *et al.* used 2D cultures to screen a chemical library for compounds that enhance *FLG* transcriptional activation and mRNA expression, suggesting a potential novel therapeutic agent for AD³³. On the other hand, 3D models replicate the stratified, squamous epithelium of epidermis, but require specific expertise and are time consuming. Epidermal equivalents consist of keratinocytes without a dermal compartment, while skin equivalents have a dermis, such as fibroblast-embedded collagen (3D model section, Supplementary Table S3). Both 2D and 3D models are amenable to treatment with disease-relevant cytokines, gene knockdown, use of patient-derived cells, and/or co-culture (Figure 2 and Supplementary Table S3).

The immune system is a major driver of AD and *in vitro* immune modulation with disease-relevant cytokines, such as interleukins (ILs), can lead to AD-like phenotypes in normal primary keratinocytes³⁴ and

191 3D models³⁵⁻⁴¹ (3D cytokine model section, Supplementary Table S3). Knockdown of filaggrin in culture
192 systems can give insight into the molecular and proteomic changes associated with its loss in AD⁴²; and
193 combining filaggrin knockdown with other perturbations, e.g., cytokine treatment, can be used to study the
194 multifactorial drivers of AD. For example, Hönzke *et al.* reported that filaggrin knockdown exacerbated
195 epidermal responses to IL-4 and 13, including increased proliferation and keratinocyte-released cytokines in
196 3D skin equivalents⁴³. Patient-derived cells for 2D and 3D culture or tissue for explant culture are limited by
197 access and availability, but may be the most relevant in terms of modeling AD⁴⁴⁻⁴⁷. Further, patient biopsies
198 can be a source of skin cells other than keratinocytes, allowing for co-culture models. Given that multiple
199 systems contribute to AD, co-culture models that include immune cells, dermal fibroblasts, and neurons
200 can begin to address their interplay with keratinocytes. For example, Berroth *et al.* derived keratinocytes
201 and fibroblasts from normal and AD skin and showed that AD-derived fibroblasts are sufficient to decrease
202 *FLG* mRNA in normal-derived keratinocytes in 3D culture⁴⁷. Moreover, combining *FLG* knockdown with
203 CD4+ activated T-cells uncovered direct cross-talk between keratinocytes and T-cells that resulted in T-cell
204 migration within the dermal compartment towards the epidermis⁴⁸. These studies highlight the levels of
205 complexity that can be engineered into the 3D culture models. 3D culture systems have also been used to
206 understand environmental influences on skin, including air pollution, ultraviolet radiation exposure, and
207 bacterial infection⁴⁹⁻⁵¹. These relevant environmental factors could therefore be incorporated into *in vitro*
208 models of AD. The 3D cultures and skin explants can also be used to assess the comparative efficacy and
209 practical applicability of novel drug delivery systems^{52, 53}. Notably, despite the assorted methodologies
210 applied in developing *in vitro* models of AD, there is overlap in the AD-like characteristics amongst the
211 various models: most produce perturbed epidermal morphology, abnormal differentiation, and barrier
212 dysfunction. Most often, disparities in reported phenotypes appear to stem, at least in part, from
213 differences in the methodologies used in evaluating models (not necessarily because of the absence of the
214 phenotype).

215

Although *in vitro* models may not mimic certain symptomatic and/or subjective aspects of the disease such as pruritus and pain, they allow monitoring of changes in epidermal morphology and differentiation, gene and protein expression, lipid synthesis, and barrier function. Histologically, AD skin sections and most 3D models of AD show profound changes in the epidermal compartment, including hypogranulosis, spongiosis, and increased cellularity due to hyperproliferation (3D model section, Supplementary Table S3). Changes in expression of genes (detected by microarray, RNA-sequencing (RNA-Seq), or qPCR) and protein (detected by liquid chromatography mass spectrometry, Western blot, ELISA, or immunohistochemistry) can be used to evaluate disturbances in differentiation and immune response in 2D and 3D models. Lipid synthesis, which is required for optimal barrier function, can be monitored by expression of related enzymes or directly by mass spectrometry. Epidermal barrier function can be monitored in 2D and 3D models, depending on the assay. We recommend that the phenotype of any AD *in vitro* model should be extensively characterized, and should include parallel analysis of epidermal morphology, differentiation status, loss or gain of key transcripts/proteins, analysis of immune components, and assessment of functional epidermal barrier parameters. Full characterization of any AD model can inform downstream evaluation of potential therapeutic agents with respect to reversing different aspects of the disease. Testing potential targets or drugs in several model types can add rigor and indicate if a signaling pathway or protein is central to the diverse manifestations of AD.

***In silico* computational models**

A core element of a systems biology approach is development of *in silico* computational models (mechanistic models) by integration of different types of experimental and clinical data from multiple studies, including those associated with disease conditions. *In silico* experiments, *i.e.* computer simulations or mathematical analysis of *in silico* models, can test model-specific hypotheses, predict disease prognosis or treatment outcomes, and identify knowledge gaps, guiding future experiments and clinical trials that produce further data. This iterative process refines *in silico* models, providing holistic systems-level

mechanistic insights into how perturbations (treatments or risk factors) lead to whole-organism phenotypes.

A mechanistic model describes causative interactions between the system's components involved in the phenomena of interest (e.g. disease or treatment outcomes). Existing mechanistic models of AD vary widely depending on the levels of interactions (tissue, cells, proteins, genes) included in the model and mathematical methods used to describe the interactions.

Domínguez-Hüttinger *et al.* developed a multi-scale deterministic model that delineates interactions between the environment, skin barrier integrity and immune activation by ordinary differential equations⁵⁴ (Table 1). Two bistable “switches” are described – the first regulating the onset of AD flares and the second controlling progression to severe and persistent disease. The model predicts, for example, that genetic predisposition to barrier dysfunction (e.g. *FLG* haploinsufficiency) predisposes to longer flares and more persistent disease and that prophylactic emollient use may be beneficial (Table 1).

Application of optimal control theory to the hybrid mathematical model can inform the design of patient-specific optimal strategies for “proactive therapy” to prevent recurrent flares once the disease has been brought under initial control⁵⁵. For example, this computational model supports the need for higher topical steroid treatment dose after disease worsening and the potential need for more frequent than 2-3 days per week application of topical steroid treatment to maintain remission⁵⁶ in patients with *FLG* haploinsufficiency (Table 1), presenting a readily testable stratification treatment regime based on genotype.

Polak *et al.* developed a stochastic Petri net model that delineates genetic regulatory mechanisms responsible for immune responses in Langerhans cells (LCs)⁵⁷ (Table 1). The model describes reported interactions between interferon regulatory factors (IRFs), IRF transcription partners and DNA sequences in a logic-based diagram. *In vitro* experiments validated model predictions that LCs' ability to present a

peptide is altered by cytokine milieu and that a PI3Kgamma inhibitor reduces the LCs' ability to induce Th1 responses. These smaller-scale and focused mechanistic models can describe detailed interactions which are difficult to be included and validated in multi-scale models. Inclusion of the detailed interactions would make the multi-scale models too complex to interpret and to be validated, due to the current lack of quantitative dynamic data that measures the variables across different scales simultaneously.

Subramanian *et al.* used a pathway model that included manually-curated skin-specific pathways and relevant genes⁵⁸ (Table 1). Pathway enrichment analysis, using transcriptomic datasets of AD patients, provided mechanistic insights into drug actions of topical betamethasone and pimecrolimus. The pathway model would allow *in silico* experiments, once the kinetics parameters for pathways are identified, to provide quantitative and dynamic predictions of disease progression and treatment outcomes.

Population pharmacokinetic and pharmacodynamic (PK/PD) models have also been developed to describe differences and variability in pharmacological effects observed in large clinical studies for AD treatments⁵⁹⁶⁰. The authors identified the model parameters that can best fit to the effects of nemolizumab and dupilumab measured in terms of AD severity score or pharmacokinetics (Table 1)⁵⁹⁶⁰. Population PK/PD models could help achieve mechanistic understanding of pharmacological effects, if combined with mechanistic models.

One of the challenges in developing mechanistic models is identification of the components and the pathways that are relevant to the model-specific hypothesis to be tested. This can be achieved by unbiased multivariate analyses of a collection of large-scale data, for example by machine learning data analysis. Application of machine learning methods to AD-related data is relatively limited at present, but some relevant works have been already published. Thijs *et al.* developed a piecewise linear mixed model to predict AD severity scores after different treatments⁶¹ and Kiiski *et al.* developed a multivariate logistic regression model to predict a "good treatment response"⁶². A sufficient level of cross-validation is crucial

to reduce bias and to ensure the general applicability of models that have predictive power beyond mere description of data.

All the models presented above were developed based on the published data derived from studies in which the inclusion and exclusion criteria for AD were specified. Whilst the majority of studies utilised the Hanifin and Rajka criteria and specified further clinical (including co-morbidities) and demographical details, it is clear that patients with AD present with a wide spectrum of clinical and molecular features (including for example a greater heterogeneity in transcriptomic profile of lesional skin compared to psoriasis)⁶³.

Future developments

The development of more sophisticated human models of AD that integrate large scale clinical and 'omic' data offer the potential for a deeper understanding of disease endotypes, molecular mechanisms underlying key pathogenic events and clinical hallmarks of AD, as well as prediction of therapeutic outcomes, including comorbidity at the level of an individual patient. Accepting that, by definition, these human models are based upon a reductionist approach, they need to reflect the complexity of AD pathogenesis, including epidermal barrier dysfunction, altered penetration of chemicals and allergens, host/environment interaction, type 2 immunity, and tissue remodeling. We have illustrated in this review that the main approaches available today are *in vitro* models, identification and characterization of human inherited syndromes resembling AD, *in vivo* challenges of AD patients, as well as *in silico* models. Here, we speculate how the future of AD research will likely inform the development of more refined human models of AD.

Refinement is likely to depend, at least in part, upon methodological advances in the field and the additional information generated by novel approaches. For example, single cell sequencing has recently identified novel rare but important immunological subsets⁶⁴ and intravital photon microscopy has enabled visualization of cell-cell communication during inflammation^{65 66}. Application of this technology to AD is likely to inform the inclusion of distinct epithelial and immune cell types⁶⁴ and/or genetically modified

primary human cells⁶⁷. Furthermore, small-scale spheroid organoids may enhance high-throughput approaches in the field⁶⁸. Finally, we expect that a technological breakthrough in the development of three-dimensional skin models will be facilitated by cell printers^{69, 70}.

Deep neural networks are being applied as artificial intelligence tools to facilitate physician interpretation in the field of melanoma diagnostics⁷¹ and increasingly as methods to enable large data set integration. The first examples of disease classifiers⁷² and prediction of disease severity from biomarker sets^{61, 73, 74} have recently been published, and we expect this line of development to continue while ensuring a sufficient level of validation. We anticipate that refinement of these methods, in combination with *in silico* models, may lead to computational approaches and predictive models applied to diagnostics and therapeutic stratification. The descriptive disease ontology of inflammatory skin diseases will need to be revised by shifting to pathogenesis-oriented structure⁷⁵ and, in the future, by better definition of disease endotypes based on integration of multiomics data, clinical features, and clinical response to therapy in light of *in silico* models as assessed in large-scale and longitudinal cohorts⁷⁶. These advances are likely to inform the development of many of the current models.

To achieve a substantial breakthrough, though, we expect that different approaches will need to be combined, integrated, standardized, and performed at larger scale (Figure 3). For example, observations made in rare human disease variants or by specific challenge models in AD patients may be validated *in vitro* and mapped to disease signatures *in silico*. Validation of functional hypotheses will increasingly depend upon cross-referencing of data derived from clinical samples with outputs from *in vitro* models. Integration of clinical, biomarker, PK/PD (topical and/or systemic) and clinical outcome data will inform therapy development and precision medicine. Notably, all of our models depend on how precisely a particular question is asked and the quality of the clinical input, including the clinical metadata and integration with omics data derived from clinical samples. Finally, advanced statistical and machine learning analysis combined with *in silico* predictive modelling will be required to integrate information

345 throughout all described layers and data sets to elucidate underlying mechanisms (and endotypes), further
346 highlighting the importance of data standardization and scientific networking.

347

348

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Figure legends

Figure 1. Diagrammatic representation of ‘Human knockout’ monogenic models providing insight into the pathomechanisms of AD. Specific genetic variants affecting the structural and/or immune functions of skin or other organs recapitulate features, but not the entire phenotype, of atopic inflammation and AD. *CARD11*, caspase recruitment domain-containing protein 11; *CDSN*, corneodesmosin; *CTLA4*, cytotoxic T lymphocyte-associated protein 4; *DOCK8*, dedicator of cytokinesis 8; *DSG1*, desmoglein 1; *DSP*, desmoplakin; *FLG*, filaggrin; *FOXP3*, forkhead-box-protein 3; *IL2RA*, interleukin-2 receptor alpha; *IL4RA*, interleukin 4 receptor alpha; *IFNGR1*, interferon gamma receptor 1; *MALT1*, mucosa-associated lymphoid tissue lymphoma translocation protein 1; *PGM3*, phosphoglucomutase 3; *RAG1*, *RAG2*, recombination-activated gene 1 and 2; *SPINK5*, serine protease inhibitor Kazal type 5; *STAT3*, signal transducer and activator of transcription 3.

Figure 2. Human *in vitro* models of AD. *In vitro* models can be designed to address specific experimental questions based on the input materials of the cultures. Assessment of the cultures, or output, depends on the type of culture. HEE, human epidermal equivalent; HSE, human skin equivalent (inset: fibroblasts in collagen); *FLG*, filaggrin; *IVL*, involucrin; *KRT10*, keratin 10; *DSG1*, desmoglein 1; *CDSN*, corneodesmosin; *TSLP*, thymic stromal lymphopoietin; TEER, trans-epithelial electrical resistance.

Figure 3. Interconnected multi-layer networks: the future of human AD modelling. To answer clinically relevant questions such as identification of distinct disease endotypes, elucidation of molecular pathomechanisms, or prediction of therapeutic response, a combination of innovative *in vitro* and *in silico* models obtained by a systems biology approach and machine learning algorithms will be needed.

ACCEPTED MANUSCRIPT

384 **Table 1**

Model Type	Scientific Merits	Clinical Utility	Limitations	Key Features	Key Findings/Predictions	Refs
Multi-scale mechanistic model	Mechanistic understanding of system-level effects of potential triggers and processes on disease state	Identification of therapeutic targets, and their mechanisms, for further clinical investigation. Prediction of dynamic effects of therapeutics, leading to patient stratification	Models developed based on hypothesized relationships that were previously described experimentally.	A hybrid ordinary differential equation model of the dynamic interplay between skin barrier function, immune responses and environmental stressors that determines AD pathogenesis	Preventive effects of emollients against AD progression (shown by clinical trials). Synergistic effects of environmental (eg. microbiome) and genetic (eg. FLG) risk factors on AD progression (shown by mice experiments with ovalbumin challenge or dose-dependent effects of FLG deficiency)	⁵⁴
				A hybrid model of treatment effects of corticosteroids and emollients on AD pathogenesis and exploration of optimal regimes for induction of remission and maintenance of remission	Poor adherence to the suggested optimal treatment schedule leads to higher treatment doses. Application of corticosteroids for 2 consecutive days per week is optimal for maintenance period	⁵⁵
Gene regulatory network model	Understanding of gene regulatory mechanisms behind disease processes	Identification of therapeutic targets, and their mechanisms, at the gene regulation level.	Models developed based on published genetic interactions.	Stochastic Petri Net model of Interferon regulatory factors gene regulatory network in response to <i>in vitro</i> treatment of Langerhans cells (LC) with TNF α and TSLP	<i>In vitro</i> experiments validated predictions that LCs' ability to present a peptide is altered by cytokine milieu and that PI3K γ inhibitor reduces the LC's ability to induce Th1 responses	⁵⁷
Pathway models	Understanding of disease mechanisms	Identification of therapeutic targets, and their mechanisms	Models developed based on published pathways.	A pathway model including 35 manually-curated skin-specific pathways and 2600+ genes.	Pathway enrichment analysis using transcriptomic datasets of 10 AD patients treated with betamethasone valerate and pimecrolimus predicted mechanism of action of both drugs on human skin	⁵⁸
Population PK/PD models	Understanding of differences and variability in pharmacological effects among a target population from clinical trials data	Prediction of optimal dose regimen. Testing effects of weight, gender etc.	Requires a large clinical data to have sufficient predictive power	PK/PD model for serum nemolizumab and pruritus VAS developed from 299 patients' time course data	An appropriate flat dose regimen that is independent of body weights	⁵⁹
				Two compartment PK model for dupilumab developed from data of 197 healthy volunteers and AD patients from 6 studies	Production rate of IL4Ra is similar for AD patients and normal volunteers, and does not change over time	⁶⁰
Machine learning predictive models	Unbiased analyses of differences between disease and non-disease (including treated) tissue/ patients and prediction of clinical outcomes (prognostic and therapeutic)	Identification of disease and therapeutic targets. Findings can feed into mechanistic models	Causative mechanisms remain largely unknown. Machine learning applications to atopic eczema relatively limited at present	Piecewise linear mixed models to predict EASI scores at 3 future timepoints from baseline biomarkers. Developed from data of 150 serum biomarkers measured in 193 AD patients	Combination of TARC, IL-22 and sIL-2R provides a good predictor for future EASI	⁶¹
				Multivariate logistic regression model to identify predictors of long-term response to topical maintenance treatment in AD on 169 patients.	Serum total IgE (rather than the initial severity) is the most important factor predicting a good long-term treatment outcome	⁶²

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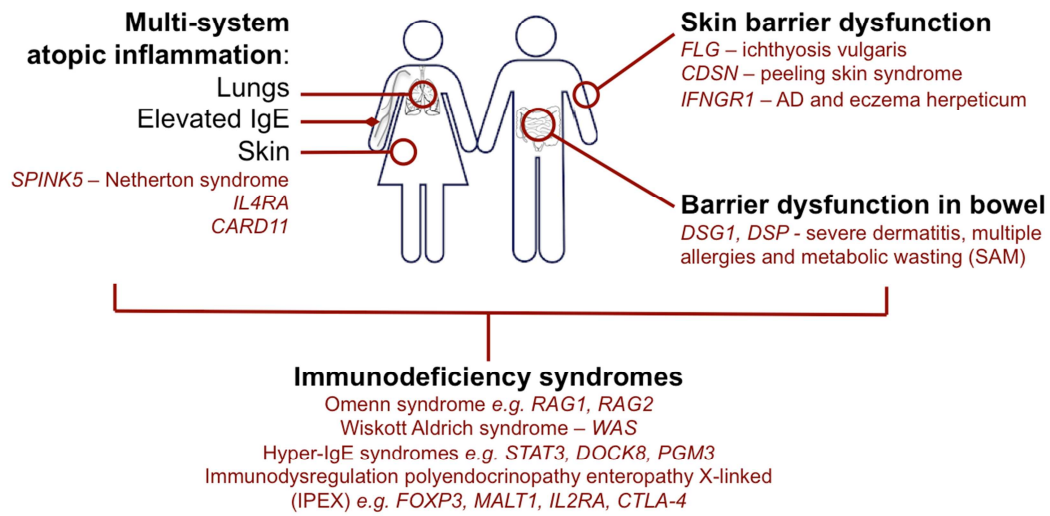
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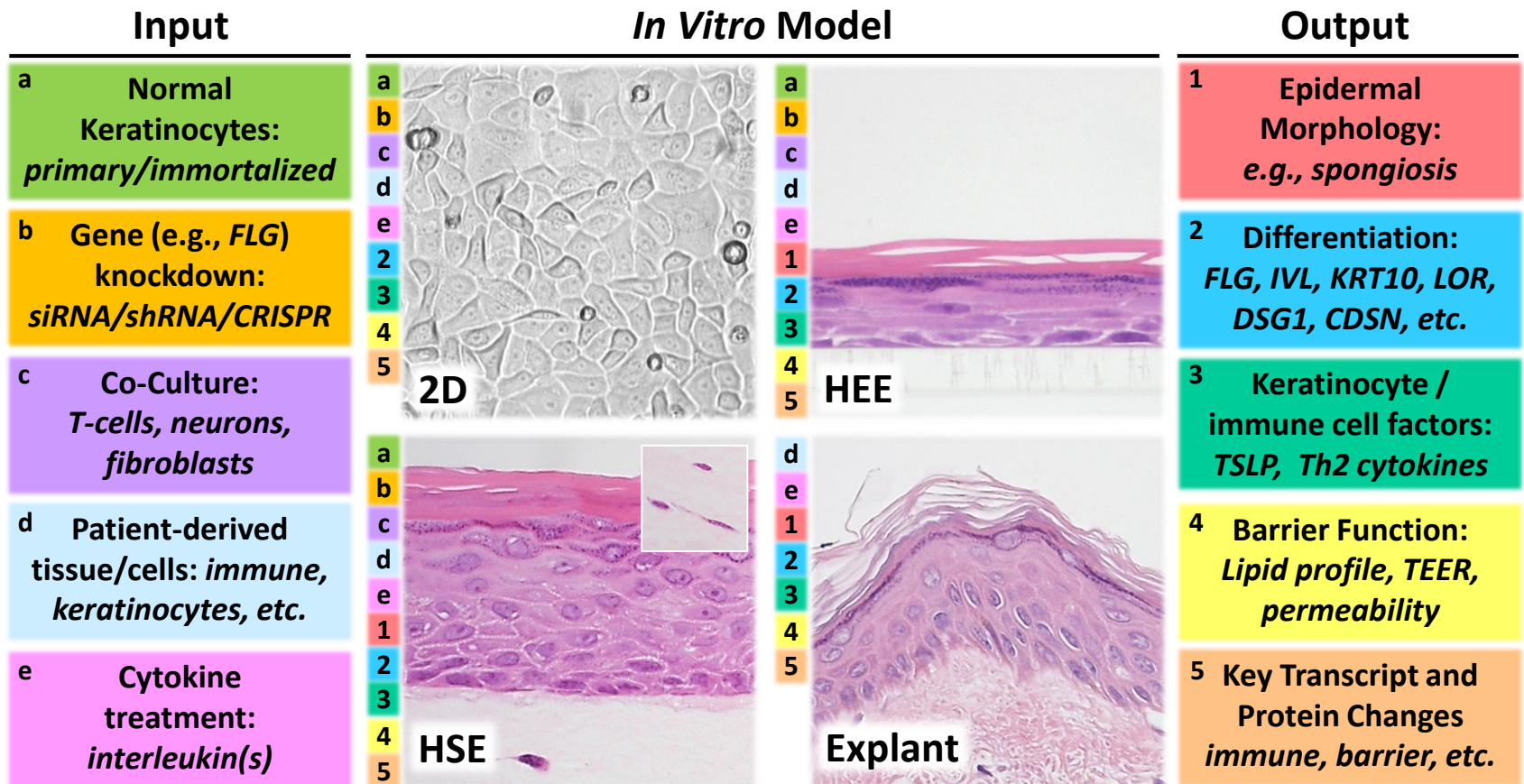
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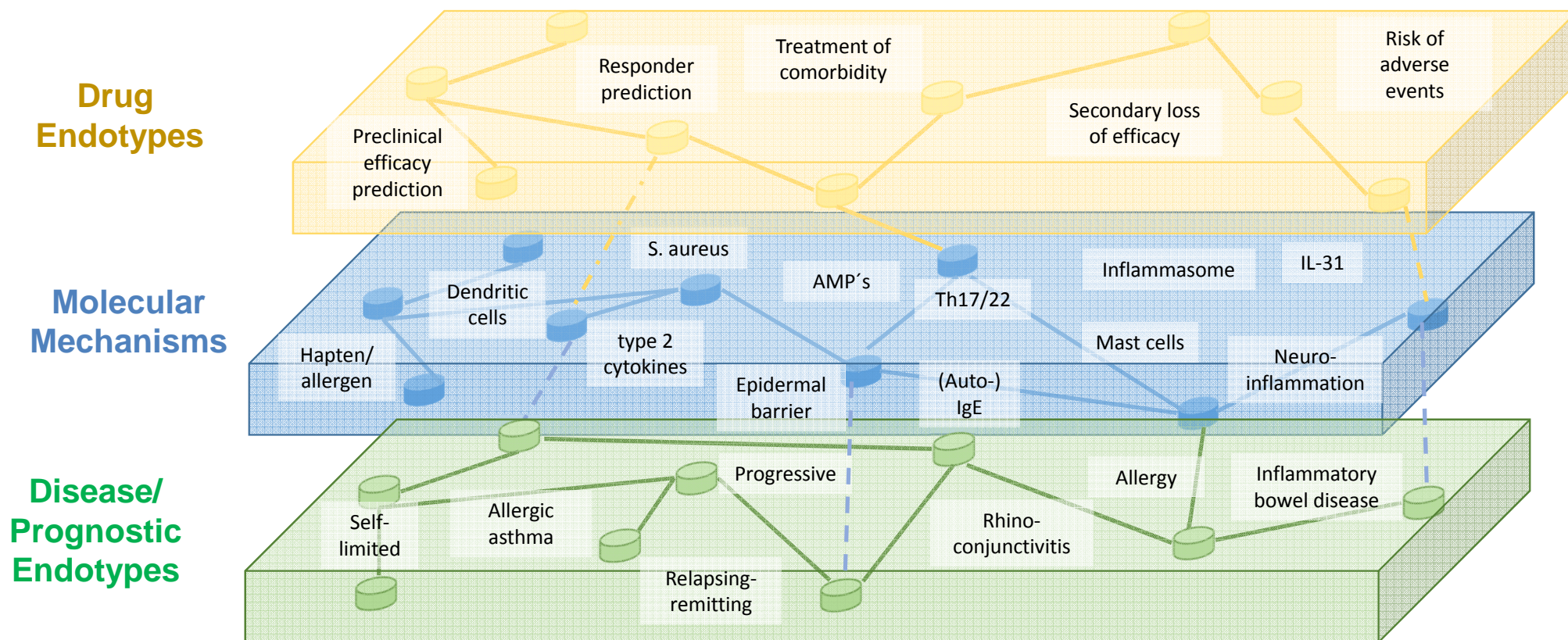
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Integration of data by systems biology and machine learning

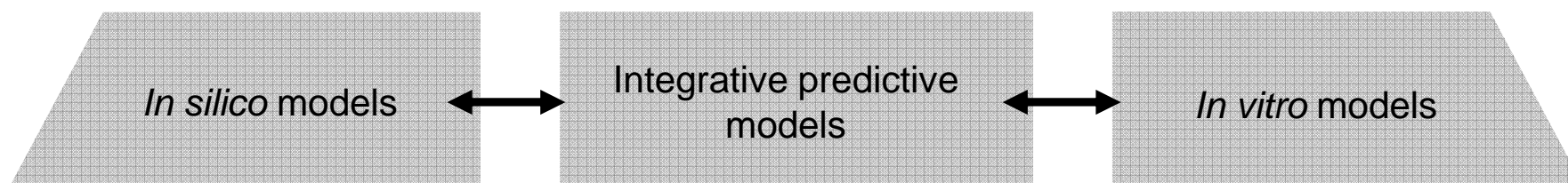


Table 1. Genetic disease models of AD

Genetic disease	Gene and mutation type(s)	Phenotype(s)	Mechanistic insights	Clinical utility	Limitations	Pathway relevance for drug development	Refs.
Skin barrier dysfunction							
Ichthyosis vulgaris (IV)	<i>FLG</i> Loss of function mutations semi-dominant in IV and complex trait in AD	Early onset, severe and persistent AD with & without other atopic diseases; predisposition to eczema herpeticum (EH)	Understanding that skin barrier dysfunction predates atopic inflammation	Illustrates importance of barrier repair	Molecular mechanisms and control pathways remain unclear		1, 2
Generalised peeling skin	<i>CDSN</i> Loss of function mutation autosomal recessive	Ichthyosiform erythroderma, pruritus and food allergies	Confirms the role of corneodesmosin in epidermal adhesion	Understanding that skin barrier dysfunction predates atopic inflammation			3
AD and eczema herpeticum	<i>IFNGR1</i> Loss of function mutation Complex trait	AD and eczema herpeticum (EH)	Defective systemic IFN-gamma immune response accounts for disseminated viral skin infections	Helps to explain why a subset of AD patients suffer recurrent EH	Does not explain all cases of EH		4
Netherton syndrome	<i>SPINK5</i> Loss of function mutation Autosomal recessive	Congenital ichthyosis, severe atopic disease, elevated IgE, hypereosinophilia, infections	Single nucleotide variants associated with AD. Illustrates role of epidermal protease inhibitors and kallikrein proteases in regulating epidermal barrier function	Understanding that skin barrier dysfunction predates atopic inflammation		Protease inhibitors	5
Systemic atopic inflammation							
Atopic disease	<i>IL4RA</i> Gain of function Complex trait	Elevated IgE with & without AD	Mutation found in severe cases is also a common risk allele in the population	Evidence of role for IL-4 in atopic inflammation		IL-4RA	6
Severe atopic disease	<i>CARD11</i> Heterozygous mutations Loss of function and dominant negative effect	Severe AD with & without infection	Illustrates importance of lymphocyte receptor signalling	mTORC1 and IFN-gamma production defects can be partially rescued by glutamine supplementation	Unclear whether this mechanism plays a role in prevalent AD	NFKB and MALT1	7
Skin inflammation and gastrointestinal inflammation							
SAM (Severe dermatitis, multiple Allergies and Metabolic wasting)	<i>DSG1</i> Homozygous loss of function mutations	Ichthyosiform erythroderma, atopic disease and failure to thrive	<i>DSG1</i> mutations lead to loss of cell-cell adhesion in epidermis	Structural epidermal defects lead to atopic inflammation			8
SAM	<i>DSP</i> Heterozygous mutation	Ichthyosiform erythroderma, atopic disease and failure to thrive	<i>DSP</i> mutations result in disrupted keratin filament attachment to desmosomes	Structural epidermal defects lead to atopic inflammation	Other <i>DSP</i> mutations cause different phenotypes without atopic manifestations		9
Immunodeficiency syndromes							
Hyper-IgE	<i>STAT3</i> Dominant negative mutations	AD-like skin inflammation, elevated IgE, immunodeficiency leading to infection	Illustrates role of STAT3 in signal transduction for multiple cytokines	Biologic treatments targeting IgE have limited clinical efficacy for AD	Immunodeficiency is not a prominent feature of AD	STAT6: downstream of JAKs in Th2 inflammation	10
	<i>DOCK8</i> Autosomal recessive loss of function mutations	AD-like skin inflammation, elevated IgE, immunodeficiency leading to infection	Aberrations of T cell and NK cell migration to skin can cause atopic inflammation	Antiviral and antibacterial prophylaxis, immunoglobulin replacement and HSCT			11
Omenn syndrome	Hypomorphic missense mutations in a range of genes involved T and B cell development eg. <i>RAG1</i> , <i>RAG2</i>	AD-like skin inflammation, elevated IgE, immunodeficiency leading to infection	Skin inflammation can occur in the absence of adaptive immunity, also seen in mice				12
							13
Hyper-IgE like syndrome	<i>PGM3</i> Autosomal recessive loss of function mutations	AD-like skin inflammation, atopy, immune deficiency, autoimmunity and neurocognitive impairment	Role of glycosylation in immune regulation and systemic atopy				
Wiskott-Aldrich	<i>WAS</i> X-linked mutations	AD-like skin inflammation, severe immunodeficiency, autoimmunity and malignancy	Systemic imbalances in Treg populations can drive cutaneous AD like inflammation	Requires HSCT		OX40	14
IPEX and IPEX-like syndromes	<i>FOXP3</i> , <i>MALT1</i> , <i>IL2RA</i> , <i>CTLA-4</i> Autosomal recessive	Immune dysregulation, polyendocrinopathy, enteropathy and AD-like skin inflammation	Role of autoimmunity in AD-like inflammation	Immunosuppressive treatment or HSCT		<i>FOXP3</i> as possible target for gene editing	15, 16

mutations

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Abbreviations

EH, eczema herpeticum; HSCT, haematopoietic stem cell transplantation; IPEX, Immunodysregulation Polyendocrinopathy Enteropathy X-linked; IV, ichthyosis vulgaris; SAM, Severe dermatitis, multiple Allergies and Metabolic wasting

Table S2. Human *In vivo* Models of AD

Atopy Patch Test	System Interplay/ Application	Key Findings	Scientific Merit/ Clinical Relevance	Limitations	Reproducibility	Refs.
APT: clinical usage		<u>Reviewed in: EAAI position paper</u>				(2)
Epidemiology	Frequency of patch test reactions to inhalant allergens in AD patients (n=56)	D. farinae: 33.9%; D. pteronyssinus: 35.8%; American cockroach: 21.8%	Positive APT reactions occur frequently in AD patients	Small cohort	Several studies with similar results, e.g. (1)	(1)
Validity/relevance	Comparison of APT and SPT in children with AD (n=253)	APT: higher specificity (69-92% depending on the allergen) than SPT (44-53%) and IgE levels (42-66%)	APT may be useful to diagnose clinically relevant sensitizations to inhalant allergens	Clinical relevance mainly evaluated by history only		(2)
	Comparison of APT and LTT in AD patients (n=96)	48% of aeroallergen sensitized patients had a positive APT; this correlated highly significant with a positive LTT	APT reactions are significantly correlated to allergen specific lymphocyte proliferation			(3)
	Comparing AD groups: with and w/o clinical symptoms (n=79)	66.7% of cases with and 10.5% of cases without a predictive history of exacerbations during pollen season	APT indicates clinically relevant positive reactions to inhalant allergens	Only investigated grass pollen, small cohort		(4)
Reproducibility	Comparing APT, SPT, and sIgE with food challenge in children with AD	In a large cohort (n=1007 APT, 873 challenges), APT to food allergens added only a small predictive value to SPT and sIgE	APT to food allergens is less robust compared to APT to inhalant allergens; higher specificity and lower sensitivity than SPT and sIgE			(5)
	Reproducibility of APT reactions in AD patients (n=16)	15/16 (94%) patients had a reproducible APT reaction	APT results are highly reproducible	Small cohort		(6)
	Different vehicles and allergen concentrations (AD patients)	Petrolatum as a vehicle and allergen concentrations of at least 1000 protein nitrogen units/ml give best outcome	Validity of APT reactions depends on vehicles and allergen concentrations			(7)
APT: immunological relevance		<u>Reviewed in:</u>				(8, 9)
Th2 immunity	Tissue cell culture from APT reactions (AD patients)	APT reactions contain Der p specific Th2 cells	APT can be used as a model for acute AD	Early proof of concept study	Reproduced in several studies, also for other allergens	(15)
Dynamics/kinetics of immune response	Comparison of APT reactions to lesional AD in AD patients	Dust mite induces a Th2/Th9 skewing, but also Th17/Th22 activation	Reaction to dust mite does not fully reflect human AD, e.g. regarding barrier	n=15		(16)
	Gene expression in lesional APT skin (AD patients)	APT to different food allergens induces Th2, Th17 responses and IL-33	APT reflects a type 2 dominated immune response			(17)
	Histology/ gene expression/ TCC from dust mite APT in AD patients	Early APT reactions are mediated by Th2, while other T cell responses occur in the course of the reaction	APT reflects acute immunity as well as later stages of AD immunity		Highly reproducible also for other allergens, e.g. (10, 11) Reproduced in (12)	(18)
	Interaction of allergen and microbiota in AD patients	Superantigens cause increased APT reaction Superantigens induce IL-17 and IL-22 in APT reactions	Microbial products influence AD			(19) (20, 21)
Specificity	Immune-histochemistry and flow cytometry of DCs in AD (n=66) compared to CD (n=12)	Inflammatory epidermal dendritic cells migrate early in APT reactions where they persist; FcεRI is associated to extrinsic AD	APT is a useful model to investigate DC subtypes	No functional analysis		(22)
	APT in patients with co-existing psoriasis and AD (n=8)	Dust mite induces a Th2 mediated eczematous reaction in sensitized psoriasis patients	At least a subgroup of AD is caused by adaptive immunity	Special, small cohort of patients	Reproduced in (13)	(23)
	APT to autoantigens in AD patients	AD patients with T cell-mediated autoimmunity against manganese superoxide show APT reactivity	Identification of manganese superoxide as autoantigen in AD		Reproduced for Malassezia sympodialis thioredoxin (14)	(24)
Contact allergens	System Interplay/ Application	Key Findings	Scientific Merit/ Clinical Relevance	Limitations	Reproducibility	Refs.
Patch testing: clinical usage		<u>Reviewed in:</u>				(25, 26)
Epidemiology	Patch tests to haptens in AD patients	AD patients with severe disease have lower prevalence of contact allergy.	Clinically relevant ACD in AD patients needs to be ruled out by patch testing.	No definite information about severity	Reproduced in a large meta-analysis	(29)
Immunological relevance	Patch tests to experimental haptens in AD patients	AD patients have attenuated ACD reactions compared to controls and in a severity-dependent manner.	Immune bias in AD reduces the ability to amount a contact allergic response.		Highly reproducible, e.g. (27, 28)	(30)
	Gene expression following patch tests	Nickel induces Th1/Th17 responses, fragrances induce a Th2/Th22 immune response	Haptens induce distinct molecular profiles; some of			(31)

	to different haptens (n=24 ACD patients w/o AD)		them might mimic AD			
	Patch tests in AD patients (n=18) and healthy volunteers (n=10)	DNCB-specific immune responses in controls were Th1 dominated; Th1 immunity was less in AD, but here a specific and stable Th2 immunity was induced towards DNCB	AD patients show a Th2 skewed ACD reaction	Small cohort (n=16 AD patients); experimental hapten		(32)
	Repetitive application of hapten	Repetitive hapten challenge caused a switch in immune response towards Th2 immunity including barrier damage	Immune responses towards a hapten might change after repetitive challenge	Murine study		(33)
Other challenge models	System Interplay/ Application	Key Findings	Scientific Merit/ Clinical Relevance	Limitations	Reproducibility	Refs.
Aero-challenge	Pollen chamber challenge of sensitized AD patients	AD patients sensitized to grass pollen reacted with worsening of AD symptoms and biomarkers	IgE might play a role in AD	No direct causal link to IgE		(34)
Treatment Standardization	Application of vehicles and/ or topical treatments in AD patients	Standardized application of different topical treatments, assessment of TSS, TEWL, and biomarkers	Approach of standardized clinical assessment of topical treatments			(35)
	Application of petrolatum (n=13 AD patients, n=36 healthy volunteers)	Petrolatum enhances antimicrobial peptides and epidermal barrier genes	Barrier restoration might also repair immune abnormalities in AD	No evidence for a specific effect of petrolatum		(36)
Trigger challenge	Application of established AD triggers (AD patients)	Hard water increases IL-4, IL-10 and IFN-gamma	Domestic hard water exposure during infancy increase risk of AD.	Experimental design does not mimic real world exposure		(37)

Abbreviations: APT: Atopy Patch Test; SPT: Skin Prick Test; LTT: Lymphocyte Transformation Test; ACD: allergic contact dermatitis; TSS: total sign score; TEWL: transepidermal water loss; DC: dendritic cell; CD: contact dermatitis

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Supplementary Table 1. Human *In vitro* Models of AD

2D Models	System Interplay/Application	Key Findings	Scientific Merit/Clinical Relevance	Limitations	Ref
Patient-derived cells	Epidermis→Immune	<u>AD HEK vs. NHEK</u> : ↑GM-CSF ; conditioned media from AD keratinocytes induced PBMC proliferation	GM-CSF associated with population-specific AD pathogenesis and severity (1-3)	No epidermal characteristics assessed; small patient cohort (<i>n</i> = 8)	(4)
FLG knockdown (KD)	Barrier→Immune/Epidermal Differentiation	<u>NHEK</u> ; <i>lentiviral KD</i> ; ↑Th2 cytokines: IL-2/4/5/13; ↓IFN γ ; ↓KRTs, ↓IVL, ↓TGM1, ↑Lor	FLG KD induces keratinocyte cytokine release (5); FLG changes are associated with AD	No assessment of lipids or barrier function; no rescue experiment	(6)
IL-4/IL-13 treatment AD drug discovery model	Immune→Barrier	<u>NHEK</u> : ↓FLG mRNA and protein	Cytokines known to drive AD	No epidermal characteristics assessed	(7)
	Barrier	Compound library screened by FLG reporter assay in HaCaT cells; <u>NHEK</u> : ↑ FLG mRNA and promoter activity by compound JTC801; ↑ FLG in 3D and explant cultures	JTC801 ↑FLG and suppressed AD-like phenotype in NC/Nga mice	Only FLG taken into consideration as a target	(8)
Immune cells only	Immune	TSLP receptor is increased in AD-derived skin-associated Th2 cells; TSLP increases IL-4 producing T-cells	TSLP highly expressed in AD keratinocytes and known to trigger dendritic cells (9)	No epidermal component	(10)
3D Models	System Interplay/Application	Key Findings	Scientific Merit/Clinical Relevance	Limitations	Ref
FLG KD Models			FLG is relevant in pathogenesis of AD (11)	FLG loss associated with 20-50% of AD (12); FLG KD does not always cause AD-like phenotype <i>in vitro</i> (13, 14)	
Human epidermal equivalent (HEE)^a	Barrier→Immune/Epidermal Differentiation	<u>NHEK</u> ; <i>lentiviral shRNA KD</i> ; epidermal thickening; FLG loss associated with changes in proteases, inflammatory, and stress-related pathways based on proteomic profiling	Findings validated in AD patient samples; data can enhance systems biology modeling of AD	No evidence changes in protein expression underlie AD phenotype	(15)
	Barrier→Epidermal Differentiation	<u>NHEK</u> ; <i>lentiviral shRNA KD</i> ; hypogranulosis; ↓corneodesmosomes; ↓NMF; ↑barrier permeability; ↑UV sensitivity; altered differentiation	FLG loss is clinically associated with barrier dysfunction; similar results with <i>FLG2 KD</i> (16)	Epidermal thinning; immune component not assessed; no rescue experiment	(17)
Human skin equivalent (HSE)^b	Barrier→Epidermal Differentiation	<u>NHEK</u> ; <i>siRNA KD</i> ; hypogranulosis; ↑barrier permeability; ↑UV sensitivity	FLG loss is clinically associated with barrier dysfunction; siRNA produced similar phenotype in other studies (18-20)	↔differentiation or lipid synthesis; immune component not assessed; no rescue experiment	(21)
FLG KD + IL-4/IL-13 HSE	Barrier→Immune/Epidermal Differentiation	<u>NHEK</u> ; <i>siRNA KD</i> ; spongiosis, ↑proliferation; ↑epidermal thickness; ↓IVL; ↓LOR; ↓OCLN; ↑TSLP; ↑DEFB4A	Combination of FLG loss and immune activation	Barrier function not assessed; no rescue experiment	(22)
Co-culture Models			Multiple systems contribute to AD		
CD45RO+ T-cell HSE	Epidermis→Immune	<u>HaCaT</u> : spongiosis; ↑apoptosis; ↓TEER; ↑cytokine release; ↑ICAM-1; ↑NT-4	Activated T-cells drive AD; dexamethasone or tacrolimus reversed 3D model phenotype	Primary keratinocytes not used	(23)
FLG KD + CD4+ T-cell	Immune→Epidermis→Immune	<u>NHEK</u> ; <i>siRNA KD</i> ; ↑IL-8 and IL-6 secretion; ↑skin surface pH; ↓ IVL; ↑barrier permeability; ↑TSLP; ↑T-cell migration; CD4+ T-cells shift to Th2/Th22	TSLP-dependent T-cell migration indicates direct T-cell/keratinocyte cross-talk	No histological changes vs. <i>FLG KD</i> without T-cells	(24)
AD cell-derived HSE	Dermis→Epidermis→Dermis	<u>Healthy NHEK + AD Fibroblasts</u> : ↓FLG/ <i>FLG</i> mRNA; ↓KRT10; epidermal thickening <u>AD HEK + Healthy Fibroblasts</u> : rescues FLG, KRT10, KRT5	Fibroblasts may mediate immune cell infiltration in skin (25)	Immune component and barrier not assessed; AD patient samples with variable FLG status;	(26)
Nerve HSE	Neurons→Epidermis	<u>NHEK</u> ; Innervated cultures alone or with substance P+CGRP neuropeptides ↑epidermal thickness and ↑Ki67; <u>AD HEK vs. NHEK</u> : ↑innervation; ↑ epidermal thickness	Increased nerve fibers in AD (27); used for drug discovery of neuron-modulating agents (28)	Immune component and barrier not assessed; porcine dorsal root ganglia used for neurons	(29)
Cytokine Models			Immune modulators are relevant to AD		
IL-4-treated HSE	Immune→Epidermal Differentiation	<u>N/TERT</u> : ↑proliferation; ↓KRT10; ↓IVL; suprabasal integrin- β 1	Assesses the effects of a single cytokine; similar effects on proliferation in NHEK (30)	Primary keratinocytes not used; IL-4 alone shown not reduce FLG in NHEK (30)	(31)
IL-4/IL-13-treated HSE	Immune→Barrier	<u>NHEK</u> ; spongiosis; ↑apoptosis; ↑phosphorylated STAT6; ↑CA2 mRNA; ↑ <i>NELL2</i> mRNA	mRNA levels matched AD biopsies No change in psoriasis-associated genes	Barrier not assessed; dexamethasone or tacrolimus did not reverse phenotype	(32)
IL-17-treated HSE	Immune →Barrier/Epidermal Differentiation	<u>NHEK</u> : ↓TEER; ↑barrier permeability; ↓TJ proteins; SC thickening; Δ in FLG and LOR localization	Loss of TJ proteins confirmed in small cohorts of normal and AD patients	Changes in keratinocyte immune signaling not assessed	(33)
IL-31RA expression + IL-31-treated HSE	Immune→Epidermal Differentiation	<u>HaCaT</u> : ↓FLG [†] ; ↓desmosomal transcripts*; ↓ <i>CASP14</i> mRNA*; ↓ <i>CDSN</i> mRNA; ↔ TJ proteins; ↑barrier permeability; ↑IL-1 α release* <u>NHEK</u> : ↓FLG; ↑antimicrobial peptides	IL-31 expression associated with AD (34); similar effects seen in HaCaT cells (35)	Most experiments performed with HaCaT cells	(36)
		<u>NHEK</u> ; <i>Cocktail</i> : <i>poly(I)C</i> , <i>TNFα</i> , <i>IL-4</i> , <i>IL-13</i> ↓FLG/ <i>FLG</i> mRNA; altered differentiation and inflammation; ↑TSLP and ↑IL-8 secretion	Transcriptomic profiling after cocktail correlates with AD datasets; ↓FLG with TNF α /IL-4, IL-13, IL-22 cocktail (37)	Barrier function not assessed	(38)
Cytokine cocktail-treated HEEs	Immune→Epidermal Differentiation	<u>NHEK</u> ; <i>Cocktail</i> : <i>IL-4</i> , <i>IL-13</i> , <i>IL-25</i> with or without methyl- β -cyclodextrin (<i>disrupts lipid rafts</i>) hypogranulosis; spongiosis; ↓TEER; ↓FLG mRNA; ↓LOR/LOR mRNA; ↑CA2/CA2 mRNA; ↑ <i>NELL2</i> mRNA	Effect on protein expression by cocktail treatment correlated with AD patient samples;	Role of membrane lipid domains not clear in AD; no change in keratinocyte TSLP	(39, 40)
		<u>NHEK</u> ; <i>Cocktail</i> : <i>TNFα</i> , <i>IL-4</i> , <i>IL-13</i> , <i>IL-31</i> spongiosis; ↑proliferation; altered differentiation; ↑TSLP; ↓fatty acids; ↓ceramides	Tested cytokines alone and in combination	Barrier function not assessed	(30)
ILs and HMGB HSE and HEE	Immune→Immune/Epidermal Differentiation	<u>NHEK</u> *: ↑epidermal alarmins (IL-33 and HMGB1) with IL-25+IFN γ ; IL-25, IL-33, IL-4, or HMGB1 treatment ↓FLG/ <i>FLG</i> mRNA; ↓IVL; ↓LOR; ↑proliferation	Effects seen in 3 epidermal culture models	epidermal thinning; barrier function not assessed	(41)
Allergy Models					
Histamine treatment HEE	Immune →Barrier/Epidermal Differentiation	<u>NHEK</u> : ↓ FLG/ <i>FLG</i> mRNA*; ↓LOR/ <i>LOR</i> mRNA*; ↓KRT10/ <i>KRT10</i> mRNA*; ↓DSG1; CDSN; ↓TJ proteins; ↑barrier permeability	Histamine mediates mast cells which are correlated to inflamed skin (42)	No change in histamine-treated explant cultures	(43)
Explant Models					
Patient samples	AD vs. normal tissue	In AD explants: ↓LOR; ↓IVL; ↓desquamation enzymes	Explants maintain AD biopsy phenotypes	Barrier function not assessed; no system perturbations	(44)
Cytokine cocktail	Immune→Skin→Immune	<i>Cocktail</i> : <i>IL-4</i> , <i>IL-5</i> , <i>IL-13</i> , <i>TNFα</i> ; ↑TSLP release; ↑IL-8; induction of dendritic cell maturation	Use of skin explants and epidermal explants; TSLP release relevant to AD (9)	AD skin samples not used; barrier function or differentiation status not tested	(45)

a, epidermal equivalents are 3D cultures with only keratinocytes; b, skin equivalents are 3D cultures with components of the dermis, e.g., collagen lattice and/or fibroblasts; ↑: increase, ↓: decrease, ↔: no change; *, effects observed in 2D cultures of the same cell type; †, effect observed in explant culture

Abbreviations: AP-1: activator protein 1; CGRP: calcitonin gene-related peptide, CAII: carbonic anhydrase II, CASP14: caspase 14, CDSN: corneodesmin, DSG1: desmoglein 1 FLG: filaggrin, GM-CSF, granulocyte-macrophage colony-stimulating factor, HMGB1: high-mobility group box 1, ICAM-1: intracellular adhesion molecule 1, IFN: interferon, IL: interleukin, IVL: involucrin, KRT: keratin, LOR: lorcrin, NELL2: neural epidermal growth factor-like 2, NHEK/HEK: normal human epidermal keratinocytes (primary), NMF: natural moisturizing factor, NT-4: neurotrophin 4 PBMC: peripheral blood mononuclear cell, STAT6: signal transducer and activator of transcription 6, TJ: tight junction, TEER: transepithelial electrical resistance, TGM1: transglutaminase 1, TSLP: thymic stromal lymphopoietin

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